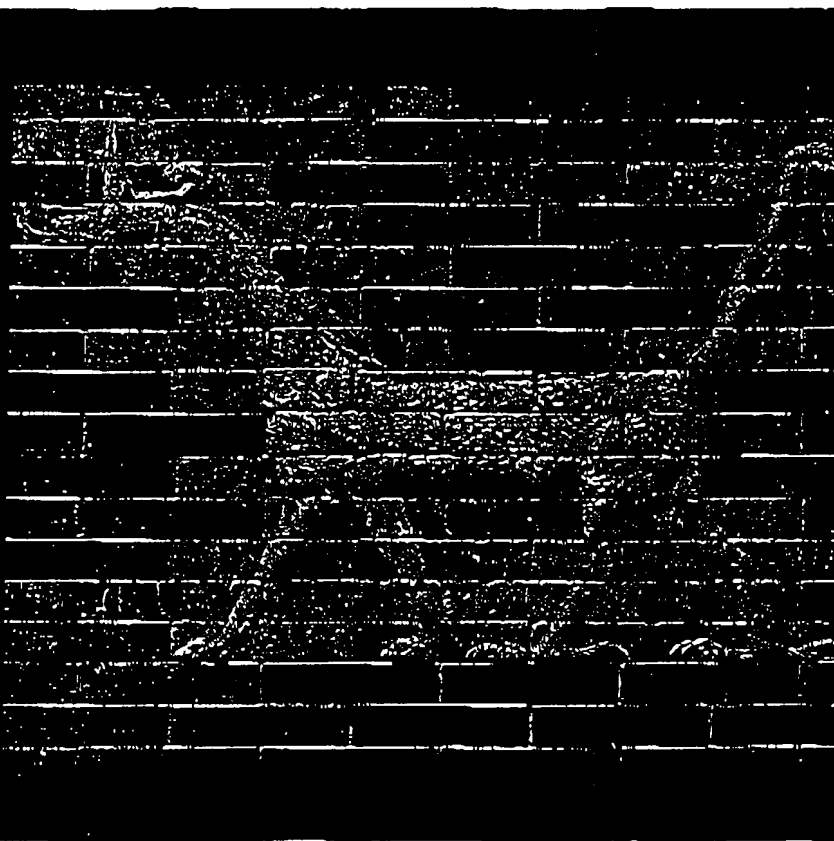


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# Handbook of Molecular Descriptors



Methods  
and Principles  
in Medicinal  
Chemistry

Volume 11

Edited by  
R. Mannhold,  
H. Kubinyi,  
H. Timmerman

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## B

backward Fukui function → quantum-chemical descriptors (© Fukui function)

Balaban centric indices → centric indices

Balaban distance connectivity index → Balaban distance connectivity indices

Balaban distance connectivity indices

The formerly proposed and the most important of this series of topological indices is the **Balaban distance connectivity index**  $J$  (also called **distance connectivity index** or **average distance sum connectivity**). It is one of the most discriminating → *molecular descriptors* and its values do not increase substantially with molecule size or number of rings; it is defined in terms of sums over each  $i$ th row of the → *distance matrix*  $D$ , i.e. the → *vertex distance degree*  $\sigma$  [Balaban, 1982; Balaban, 1983a]. It is defined as:

$$J = \frac{B}{C+1} \cdot \sum_b (\sigma_i \cdot \sigma_j)^{-1/2} = \frac{1}{C+1} \cdot \sum_b (\bar{\sigma}_i \cdot \bar{\sigma}_j)^{-1/2}$$

where  $\sigma_i$  and  $\sigma_j$  are the vertex distance degrees of two adjacent atoms, and the sum runs over all the molecular bonds  $b$ ;  $B$  is the number of bonds in the molecular graph  $G$ , and  $C$ , called the → *cyclomatic number*, the number of rings. The denominator  $C+1$  is a normalization factor against the number of rings in the molecule.  $\bar{\sigma}_i = \sigma_i/B$  is the **average vertex distance degree**; it was observed that within an isomeric series the average distance degrees are low in the more branched isomers.

To further improve the discriminant power of the Balaban index  $J$ , a set of new LOVIs was defined as:

$$t_i = \frac{\sigma_i}{\bar{\sigma}_i}$$

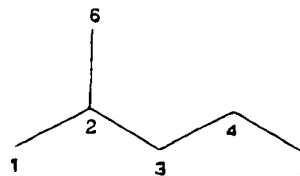
where  $\bar{\sigma}_i$  is the  $i$ th → *vertex degree*. Therefore, the  $J_t$  index was defined as:

$$J_t = \frac{B}{C+1} \cdot \sum_b (t_i \cdot t_j)^{-1/2}$$

The idea behind these LOVIs is that usually the vertices with the highest distance sums have the lowest vertex degrees, thus enhancing the intramolecular differences [Balaban, 1994a].

The  $J$  index for multigraphs is calculated by the distance sums of the → *multigraph distance matrix* where the distances are obtained by weighting each edge with the inverse of its → *conventional bond order* (→ *relative topological distance*); the sum runs over all pairs of adjacent vertices and  $B$  is the number of edges in the graph without accounting for their multiplicity.

## Example : 2-methylpentane



Distance matrix D

Atom	1	2	3	4	5	6	$\sigma_i$
1	0	1	2	3	4	2	12
2	1	0	1	2	3	1	8
3	2	1	0	1	2	2	8
4	3	2	1	0	1	3	10
5	4	3	2	1	0	4	14
6	2	1	2	3	4	0	12

Vertex degrees

Atom	$\delta_i$	$t_i$
1	1	12
2	3	2.667
3	2	4
4	2	5
5	1	14
6	1	12

$$J = \frac{B}{C+1} \cdot [(\sigma_1 \cdot \sigma_2)^{-1/2} + (\sigma_6 \cdot \sigma_2)^{-1/2} + (\sigma_2 \cdot \sigma_3)^{-1/2} + (\sigma_3 \cdot \sigma_4)^{-1/2} + (\sigma_4 \cdot \sigma_5)^{-1/2}] =$$

$$= 5 \cdot [(12 \cdot 8)^{-1/2} + (12 \cdot 8)^{-1/2} + (8 \cdot 8)^{-1/2} + (8 \cdot 10)^{-1/2} + (10 \cdot 14)^{-1/2}] = 2.6272$$

$$J_t = \frac{B}{C+1} \cdot [(t_1 \cdot t_2)^{-1/2} + (t_6 \cdot t_2)^{-1/2} + (t_2 \cdot t_3)^{-1/2} + (t_3 \cdot t_4)^{-1/2} + (t_4 \cdot t_5)^{-1/2}] =$$

$$= 5 \cdot [(12 \cdot 2.667)^{-1/2} + (12 \cdot 2.667)^{-1/2} + (2.667 \cdot 4)^{-1/2} + (4 \cdot 5)^{-1/2} + (5 \cdot 14)^{-1/2}] = 5.0141$$

## Box B-1.

In order to account for both bond multiplicity and heteroatoms, Balaban modified distance connectivity indices  $J^X$  and  $J^Y$  were proposed [Balaban, 1986a; Balaban *et al.*, 1990a]. These are defined in the same way as the Balaban distance connectivity index but derived from the  $\rightarrow$  multigraph distance matrix  $D$  instead of the original distance matrix  $D$ :

$$J^X = \frac{B}{C+1} \cdot \sum_b (\sigma_i^X \cdot \sigma_j^X)^{-1/2}$$

$$J^Y = \frac{B}{C+1} \cdot \sum_b (\sigma_i^Y \cdot \sigma_j^Y)^{-1/2}$$

where  $B$  is the bond number,  $C$  is the cyclomatic number, and the sum runs over all bonds  $b$  in the graph, each being weighted by the inverse square root of the product of the  $\rightarrow$  multigraph distance degree of the incident vertices. The distance degrees are calculated as:

$$\sigma_i^X = X_i \cdot \sigma_i = X_i \cdot \sum_{j=1}^A [\sigma_i^D]_{ij} \quad \text{and} \quad X_i = 0.4196 - 0.0078 \cdot Z_i + 0.1567 \cdot L_i$$

$$\sigma_i^Y = Y_i \cdot \sigma_i = Y_i \cdot \sum_{j=1}^A [\sigma_i^D]_{ij} \quad \text{and} \quad Y_i = 1.1191 + 0.0160 \cdot Z_i - 0.0537 \cdot L_i$$

where  $\sigma$  is the vertex distance degree calculated on multigraph distance matrix  $\sigma^D$ , the quantities  $X$  and  $Y$  are recalculated atomic Sanderson electronegativities and covalent radii relative to carbon atom, obtained as a function of the atomic number  $Z_i$  and the principal quantum number  $L_i$  of the atom; for atoms different from B, C, N, O, F, Si, P, S, Cl, As, Se, Br, Te, and I the  $X$  and  $Y$  values are set at one.  $X$  and  $Y$  indices account for the presence of heteroatoms in the molecule.

Another generalization of the Balaban index  $J$ , so as to account for heteroatoms in the molecule, is the  $\rightarrow$  Barysz index calculated on the  $\rightarrow$  Barysz distance matrix.

$\rightarrow JJ$  indices derived from the  $\rightarrow$  Wiener matrix were proposed as a generalization of the Balaban index in analogy with the Kier-Hall  $\rightarrow$  connectivity indices.

The 3D-Balaban index  ${}^{3D}J$  was derived from the  $\rightarrow$  geometry matrix  $G$  as:

$${}^{3D}J = IB(G) = \frac{B}{C+1} \cdot \sum_b (\sigma_{\sigma_i} \cdot \sigma_{\sigma_j})_b^{-1/2}$$

where  $IB$  is the  $\rightarrow$  Ivanciuc-Balaban operator,  $\sigma_{\sigma_i}$  and  $\sigma_{\sigma_j}$  are the  $\rightarrow$  geometric distance degree of the two vertices incident with the  $b$  bond [Mihalic *et al.*, 1992a].

A Balaban-type index  $DJ$  [Balaban and Diudea, 1993] was defined as:

$$DJ = \sum_{i=1}^A d_{ji} = \sum_{i=1}^A \sum_{j \in V_{i1}} \left( \frac{\sigma_i}{w_i(1+f_i)} \cdot \frac{\sigma_j}{w_j(1+f_j)} \right)^{-1/2}$$

where  $A$  is the  $\rightarrow$  atom number,  $f$  is the  $\rightarrow$  multigraph factor,  $w$  is a weighting factor accounting for heteroatoms, and the inner sum runs over all vertices  $j$  at distance 1 from the  $i$ th atom, i.e. vertices bonded to the  $i$ th atom;  $d_j$  are local vertex invariants accounting for heteroatoms and bond multiplicity. When the factor  $w$  is equal to one and the multigraph factor is equal to zero then the index  $DJ$  is related to the Balaban index  $J$  by the following:

$$DJ = 2 \cdot J \cdot \frac{C+1}{B}$$

[Balaban and Quintar, 1983] [Barysz *et al.*, 1983a] [Balaban and Filip, 1984] [Balaban *et al.*, 1985e] [Sabljic, 1985] [Mekenyan *et al.*, 1987] [Balaban and Ivanciuc, 1989] [Balaban *et al.*, 1990b] [Balaban *et al.*, 1992a] [Nikolic *et al.*, 1993a] [Guo and Randic, 1999]

Balaban ID number  $\rightarrow$  ID numbers

Balaban modified distance connectivity indices  $\rightarrow$  Balaban distance connectivity indices

Balaban-type index  $\rightarrow$  Balaban distance connectivity indices

Bartell resonance energy  $\rightarrow$  resonance indices

barycentre : centre of mass  $\rightarrow$  centre of a molecule

Barysz Index  $\rightarrow$  weighted matrices

Barysz distance matrix  $\rightarrow$  weighted matrices

Kekulé structure count : Kekulé number

Kellog and Abraham interaction field  $\rightarrow$  molecular interaction fields  
( $\odot$  hydrophobic fields)

Kier alpha-modified shape descriptors  $\rightarrow$  Kier shape descriptors

Kier bond rigidity index  $\rightarrow$  flexibility indices

Kier-Hall connectivity indices : connectivity indices of  $m$ th order  $\rightarrow$  connectivity indices

Kier-Hall connectivity matrix  $\rightarrow$  weighted matrices

Kier-Hall electronegativity  $\rightarrow$  vertex degree

Kier-Hall solvent polarity index  $\rightarrow$  electric polarization descriptors

Kier molecular flexibility index  $\rightarrow$  flexibility indices

Kier steric descriptor  $\rightarrow$  steric descriptors

Kier shape descriptors ( $\kappa$ )

Topological shape descriptors  ${}^m\kappa$  defined in terms of the number of graph vertices  $A$  and the number of paths  ${}^mP$  with length  $m$  ( $m = 1, 2, 3$ ) in the  $\rightarrow H$ -depleted molecular graph, according to the following:

$${}^1\kappa = 2 \cdot \frac{{}^1P_{\max} \cdot {}^1P_{\min}}{({}^1P)^2} = \frac{A(A-1)^2}{({}^1P)^2} \quad {}^2\kappa = 2 \cdot \frac{{}^2P_{\max} \cdot {}^2P_{\min}}{({}^2P)^2} = \frac{(A-1)(A-2)^2}{({}^2P)^2}$$
$${}^3\kappa = 4 \cdot \frac{{}^3P_{\max} \cdot {}^3P_{\min}}{({}^3P)^2} = \begin{cases} \frac{(A-3)(A-2)^2}{({}^3P)^2} & \text{for even } A \ (A > 3) \\ \frac{(A-1)(A-3)^2}{({}^3P)^2} & \text{for odd } A \ (A > 3) \end{cases}$$

where  ${}^mP_{\min}$  and  ${}^mP_{\max}$  are the minimum and maximum  $m$ th order  $\rightarrow$  path count in the molecular graphs of molecules with the same  $\rightarrow$  atom number  $A$  [Kier, 1985; Kier, 1986b]. These extremes are obtained from two reference structures chosen in an isomeric series and, for the  $i$ th molecule, is therefore:

$${}^mP_{\min} \leq {}^mP_i \leq {}^mP_{\max}$$

The reference structure for  ${}^1P_{\min}$  is the  $\rightarrow$  linear graph while for  ${}^1P_{\max}$  it is the  $\rightarrow$  complete graph in which all atoms are bonded to each other; their numerical values are calculated as follows:

$${}^1P_{\min} = A - 1 \quad {}^1P_{\max} = \frac{A(A-1)}{2}$$

The scaling factor of 2 in the numerator of  ${}^1\kappa$  index formula makes the value  ${}^1\kappa = A$  when there are no cycles in the graph of the molecule. Monocyclic molecules have a lower value and bicyclic structures have an even lower value. The structural information encoded in  ${}^1\kappa$  is related to the complexity, or more precisely, the number of cycles of a molecule.

The reference structure for  ${}^2P_{\min}$  is the linear graph, while for  ${}^2P_{\max}$  it is the  $\rightarrow$  star graph, in which all atoms but one are adjacent to a central atom; their numerical values are calculated as follows:

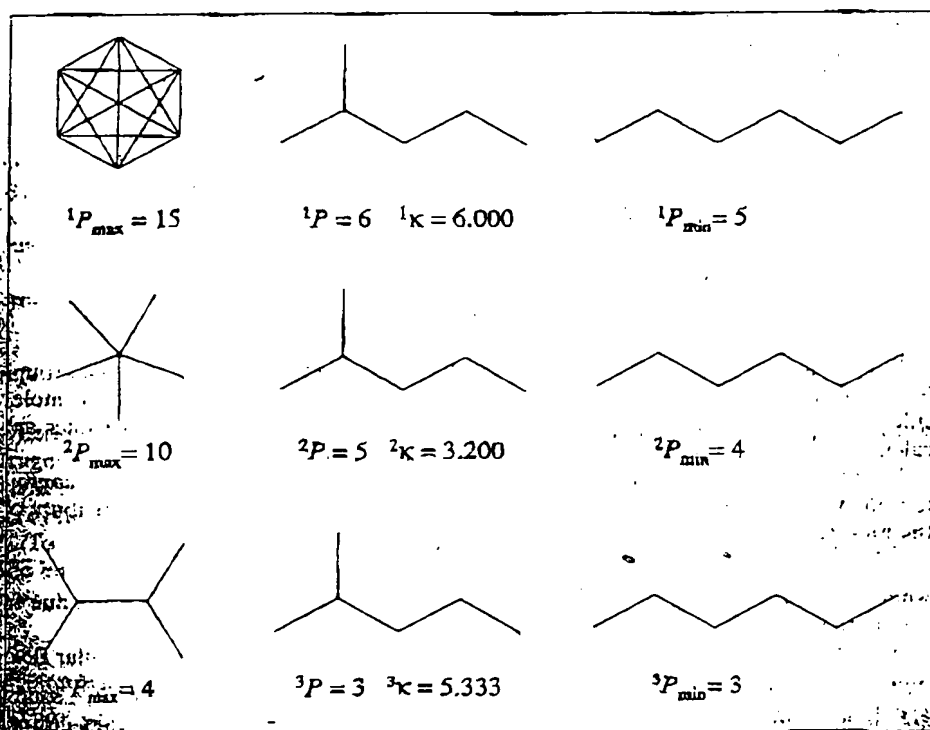
$${}^2P_{\min} = A - 2 \quad {}^2P_{\max} = \frac{(A-1)(A-2)}{2}$$

where  $A$  is the total number of vertices in the graph. The scaling factor of 2 in the numerator of  ${}^2\kappa$  index formula makes the value  ${}^2\kappa = A - 1$  for all linear graphs. The information encoded by  ${}^2\kappa$  index is related to the degree of star graph-likeness and linear graph-likeness, i. e.  ${}^2\kappa$  encodes information about the spatial density of atoms in a molecule.

The reference structure for  ${}^3P_{\min}$  is the linear graph while for  ${}^3P_{\max}$  it is the *twin star graph*; their numerical values are calculated as follows:

$${}^3P_{\min} = A - 3 \quad {}^3P_{\max} = \begin{cases} \frac{(A-2)^2}{4} & \text{for even } A \\ \frac{(A-1)(A-3)}{4} & \text{for odd } A \end{cases}$$

The scaling factor of 4 is used in the numerator of  ${}^3\kappa$  index to bring  ${}^3\kappa$  onto approximately the same numerical scale as the other kappa indices. The  ${}^3\kappa$  values are larger when  $\rightarrow$  molecular branching is nonexistent or when it is located at the extremities of a graph;  ${}^3\kappa$  encodes information about the centrality of branching.



Box K-1.

To take into account the different shape contribution of heteroatoms and hybridization states, Kier alpha-modified shape descriptors  ${}^m\kappa_\alpha$  ( $m = 1, 2, 3$ ) were proposed [Kier, 1986a] by the following:

$${}^1\kappa_\alpha = \frac{(A + \alpha)(A + \alpha - 1)^2}{(1P + \alpha)^2} \quad {}^2\kappa_\alpha = \frac{(A + \alpha - 1)(A + \alpha - 2)^2}{(2P + \alpha)^2}$$

$${}^3\kappa_\alpha = \begin{cases} \frac{(A + \alpha - 3)(A + \alpha - 2)^2}{(3P + \alpha)^2} & \text{for even } A (A > 3) \\ \frac{(A + \alpha - 1)(A + \alpha - 3)^2}{(3P + \alpha)^2} & \text{for odd } A (A > 3) \end{cases}$$

where  $\alpha$  is a parameter derived from the ratio of the  $\rightarrow$  covalent radius  $R_i$  of the  $i$ th atom relative to the  $sp^3$  carbon atom ( $R_{Csp^3}$ ):

$$\alpha = \sum_{i=1}^A \left( \frac{R_i}{R_{Csp^3}} - 1 \right)$$

The only non-zero contributions to  $\alpha$  are given by heteroatoms or carbon atoms with a valence state different from  $sp^3$  (Table K-1).

Table K-1. Covalent radius  $R$  and  $\alpha$  parameter values.

Atom / Hybrid	$R$ (Å)	$\alpha$	Atom / Hybrid	$R$ (Å)	$\alpha$
$C_{sp^3}$	0.77	0	$P_{sp^3}$	1.10	0.43
$C_{sp^2}$	0.67	-0.13	$P_{sp^2}$	1.00	0.30
$C_{sp}$	0.60	-0.22	$S_{sp^3}$	1.04	0.35
$N_{sp^3}$	0.74	-0.04	$S_{sp^2}$	0.94	0.22
$N_{sp^2}$	0.62	-0.20	F	0.72	-0.07
$N_{sp}$	0.55	-0.29	Cl	0.99	0.29
$O_{sp^3}$	0.74	-0.04	Br	1.14	0.48
$O_{sp^2}$	0.62	-0.20	I	1.33	0.73

Kappa indices can also be calculated for molecular fragments and functional groups X. The calculation of these indices for groups was performed using a "pseudo-molecule" X-X: two fragments X of the same kind are linked together, kappa values are calculated for the pseudo-molecule and this is then divided by two.

In order to quantify the shape of the whole molecule, Kier proposed a linear combination of the above defined  $\kappa$  indices, each representing a particular shape attribute of the molecule:

$$\text{shape} = b_0 \cdot {}^0\kappa + b_1 \cdot {}^1\kappa + b_2 \cdot {}^2\kappa + b_3 \cdot {}^3\kappa$$

where  ${}^0\kappa$  is the  $\rightarrow$  Kier symmetry index used to encode the shape contributions due to symmetry.

Specific combinations of  $\kappa$  indices were also proposed as indices of molecular flexibility ( $\rightarrow$  Kier molecular flexibility index) and steric effects ( $\rightarrow$  Kier steric descriptor).

[Kier, 1986c] [Kier, 1987a] [Kier, 1987b] [Kier, 1987c] [Gombar and Jain, 1987a] [Mokrosz, 1989] [Kier, 1990] [Hall and Kier, 1991] [Skvortsova et al., 1993] [Kier, 1997] [Hall and Vaughn, 1997b]

Kier symmetry index  $\rightarrow$  symmetry descriptors

$K_z$  index  $\rightarrow$  Hosoya Z matrix

## Appendix C. Software

Some packages explicitly related to the calculation of the molecular descriptors for QSAR/QSPR are collected below, in alphabetic order.

General programs for computational quantum-chemistry, molecular modelling and log $P$  calculations are not explicitly considered in this list. An extended list of computational chemistry programs can be found at the WebSite <http://www.netsci.org/Resources/Software/>.

ADAPT	Prof. P.C. Jurs, PennState University, University Park, PA 16802, USA
Description:	A QSAR toolkit with descriptor generation (topological, geometrical, electronic, and physicochemical descriptors), variable selection, regression and artificial neural network modelling.
Reference:	[Jurs <i>et al.</i> , 1979]
WebSite:	<a href="http://zeus.chem.psu.edu/">http://zeus.chem.psu.edu/</a>
ASP	Oxford Molecular Ltd., Oxford Science Park, Oxford OX4 4GA, UK
Description:	Calculates a quantitative measure of molecular similarity based on molecule alignment, shape and electronic properties. Within TSAR 3D package.
WebSite:	<a href="http://www.oxmol.com/">http://www.oxmol.com/</a>
CERIUS <sup>2</sup>	Molecular Simulations Inc. - 9685 Scranton Road, San Diego, CA 92121-7352, USA
Description:	C2-Descriptors provides a range of generic descriptors, describing topological, electronic, and structural features.
WebSite:	<a href="http://www.msi.com/life/products/cerius2/modules/descriptor.html">http://www.msi.com/life/products/cerius2/modules/descriptor.html</a>
CODESSA	Semichem Inc. - 7204 Mullen, Shawnee, KS 66216, USA
Description:	Calculation of several topological, geometrical, constitutional, thermodynamic, electrostatic, and quantum-chemical descriptors, including tools for regression modelling and variable selection.
Reference:	[Katritzky <i>et al.</i> , 1995]
WebSite:	<a href="http://www.semichem.com/">http://www.semichem.com/</a>
DRAGON	Prof. R. Todeschini - distributed by Talete srl, via Pisani 13, 20124 Milano, Italy
Description:	Calculation of several sets of molecular descriptors from molecular geometries (topological, geometrical, WHIM, 3D-MORSE, molecular profiles, etc.).
WebSite:	<a href="http://www.disst.unimib.it/chm/">http://www.disst.unimib.it/chm/</a>
GRIN/GRID	Molecular Discovery Ltd. - West Way House, Elms Parade, Oxford OX2 9LL, UK
Description:	Calculates the GRID empirical force field at grid points. Last release: V.11 - 1993
Reference:	[Goodford, 1985]



## Appendix C. Software

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HQSAR	Tripes Inc. - 1699 South Hanley Rd., St. Louis, MO 63144-2913, USA
Description:	A part of the SYBYL environment providing hologram descriptors.
WebSite:	<a href="http://www.tripos.com/">http://www.tripos.com/</a>
HYBOT-PLUS	Prof. O. Raevsky - Russian Academy of Science, IPAC
Description:	Calculation of hydrogen bond and free energy factors.
Reference:	[Raevsky, 1997]
WebSite:	<a href="http://www.ipac.ac.ru/qsar/index.htm">http://www.ipac.ac.ru/qsar/index.htm</a>
HYPERCHEM 6	Hypercube, Inc. - 1115 NW 4th Street, Gainesville, FL 32601, USA
Description:	Calculation of optimized geometries with several computational methods, also providing total surface area, molecular volume, molar refractivity, log P, polarizability and atomic charges. Last release: 6
WebSite:	<a href="http://www.hyper.com/">http://www.hyper.com/</a>
MOLCONN-Z	Prof. L.H. Hall - 2 Davis Street, Quincy, MA 02170, USA
Description:	Successor of MOLCONN-X, MOLCONN-Z calculates the most well-known topological descriptors, including electrotopological and orthogonalized indices. Last release: 3.0
WebSite:	<a href="http://www.eslc.vabiotech.com/molconn/manuals/310s/preface1.html">http://www.eslc.vabiotech.com/molconn/manuals/310s/preface1.html</a>
MULTICASE	Multicase Inc. - PO 22517, Beachwood, OH 44122, USA
Description:	Prediction of biological activities by substructure descriptors.
Reference:	[Klopman, 1992]
WebSite:	<a href="http://www.multicase.com/">http://www.multicase.com/</a>
OASIS	Prof. O. Mekenyan - Bourgas University, 8010 Bourgas, Bulgaria
Description:	Calculation of steric, electronic, and hydrophobic descriptors.
Reference:	[Mekenyan <i>et al.</i> , 1990a]
WebSite:	<a href="http://omega.btu.bg/~omekenya/">http://omega.btu.bg/~omekenya/</a>
PETRA	Molecular Networks GmbH - Langemarckplatz 1, D-91054 Erlangen (Germany)
Description:	Empirical methods for the calculation of charges and bond energies for use in QSAR.
Reference:	[Gasteiger, 1988; Löw and Saller, 1988]
POLLY	Prof. S. Basak - Minnesota University of Duluth, 5013 Miller Trunk Highway, Duluth, MN 55811, USA
Description:	Calculation of topological connectivity indices. Last release: 2.3
Reference:	[Basak <i>et al.</i> , 1983a]

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## Appendix C. Software

SciQSAR 2D	SciVision - 200 Wheeler Road, Burlington, MA 01803, USA
Description:	Calculation of several topological molecular descriptors (connectivity, shape, electrotopological descriptors).
WebSite:	<a href="http://www.scivision.com/">http://www.scivision.com/</a>
SYBYL/QSAR	Tripos Inc. - 1699 South Hanley Rd., St. Louis, MO 63144-2913, USA
Description:	SYBYL module for the calculation of EVA descriptors, CoMFA and CoMSIA fields, also including several QSAR tools. Last release: 6.1
WebSite:	<a href="http://www.tripos.com/">http://www.tripos.com/</a>
TSAR	Oxford Molecular Ltd., Oxford Science Park, Oxford OX4 4GA, UK
Description:	Statistical and database functions with molecular and substituent property calculations. Within TSAR 3D package.
Reference:	<a href="http://www.oxmol.com/">http://www.oxmol.com/</a>

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